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LARGE-SCALE SUPPLY CHAIN PLANNING
SYSTEM AND METHOD

TECHNICAL FIELD OF THE INVENTION

The present invention relates in general to computer-implemented supply chain planning and, in particular, but not exclusively, to a large-scale supply chain planning system and method.

BACKGROUND OF THE INVENTION

A supply chain planning problem can be defined, for example, as a series of planning problems that typically includes such problems as (1) demand forecasting, (2) service level planning, and (3) replenishment planning. Demand forecasting is a method used to project the future demand for a particular item at a particular location, based on historical sales information. Service level planning is a method used to compute safety stock limits and ordering policies for items, based on customer service levels for the items and their future demand. Replenishment planning is a method used to generate suggested purchase orders and distribution orders for items, based on the future demand and actual orders for the items, but still respecting the safety stock limits for the items and other supply chain constraints imposed.

The size of a supply chain planning problem is typically measured by (1) the number of locations within the supply chain, (2) the number of items in the supply chain, (3) the length of the planning period, and (4) the complexity of the business rules imposed. For example, in the retail industry, a retailer might have to manage an inventory of more than 100,000 items at 1,000 locations for a period of 26 weeks. As the magnitudes of these numbers indicate, a large-scale supply chain planning problem involves the processing and movement of enormous amounts of data. Typically, supply chain planning data (e.g., inventory item information) can be stored in a relational database.

FIGURE 1 illustrates a typical supply chain planning system 10. When a planning process application 12 (e.g., planning application software executed by a computer

processor) is initiated, the application reads, via a suitable transmission link 14, the data needed for a planning problem from a database 16. Next, the planning process application 12 solves the planning problem by applying one or more planning algorithms to the retrieved data, in accordance with any supply chain constraints imposed. The results of the planning process 12 (e.g., solutions to the planning problem or problems) are then written, via a suitable link 18, to the database 16.

Unfortunately, large-scale, supply chain planning is not performed very efficiently using only one planning process. For example, as illustrated by FIGURE 1, in order to solve a large-scale, supply chain planning problem, all of the data maintained for all items at all locations have to be read from a single database and processed. Then, the solutions or resulting data have to be written back to that database. Consequently, for a supply chain with a relatively large number of items and locations, the volume of data to be processed and conveyed to/from the database is tremendous. In fact, for such a large dataset, the planning process and database read/write operations for a conventional system require an exceedingly large amount of processing time.

FIGURE 2 illustrates how a planning process for a large scale supply chain can be performed more rapidly than the planning process shown in FIGURE 1. In FIGURE 2, a large planning problem is solved by a plurality of planning processes 22, 24, 26. The planning processes 22, 24 and 26 are performed simultaneously. For example, each planning process 22, 24, 26 reads a respective subset of data from the database 28, and then solves the planning problem by applying planning algorithms to the

respective data subsets and the supply chain constraints imposed. Finally, each planning process 22, 24, 26 writes the respective results (e.g., solutions to the planning problem) to the database 28.

5   As illustrated by FIGURE 2, although the simultaneous use of multiple planning processes may improve the scalability (ease with which a system can be modified to accommodate increases in system loads and transaction complexity) of large scale planning systems

10   to a certain extent, the simultaneous reads and writes of the large subsets of data to and from the database by the multiple planning processes create a severe bottleneck for the flow of data at the database. As such, the number of read and write operations that can be performed

15   by multiple planning processes to a centralized database, such as database 28, is not proportional to the number of planning processes used. In fact, centralized databases typically behave anti-proportionately as more and more processes are used which read and write data, because of

20   thrashing (degraded performance because miss rate too high) and the negative performance effects of read/write contentions. Therefore, the overall performance of a system using multiple planning processes versus a single planning process for large scale supply chain planning is

25   not significantly improved.

SUMMARY OF THE INVENTION

According to the present invention, problems and disadvantages associated with previous techniques for performing large scale supply chain planning may be substantially reduced or eliminated.

According to one embodiment of the present invention, a system and method for performing large scale supply chain planning includes at least one database with a plurality of partitions. A large scale, supply chain planning problem is decomposed into a plurality of independent and isolated sub-problems. The data for each sub-problem is maintained in a separate database partition. The sub-problems are solved by separate planning processes operating in parallel in a distributed database processing environment.

Certain embodiments of the present invention may provide one or more technical advantages over previous techniques. For example, the supply chain planning system and method of the present invention performs the read and write operations for different sub-problems on data maintained in separate database partitions. Also, the different sub-problems are solved in parallel. By maintaining the data for the different sub-problems in separate partitions, and solving the sub-problems in parallel, the potential effects of thrashing and database read/write contentions may be minimized. Consequently, the scalability, efficiency, and performance of the overall supply chain planning system and process may be significantly improved. Furthermore, by processing a plurality of planning problems in parallel, the elapsed time for the overall supply chain planning process may be reduced nearly proportionately to the number of

processors available in the distributed system. Other technical advantages of the present invention may be readily apparent to one skilled in the art from the included figures, description and claims.

BRIEF DESCRIPTION OF THE DRAWINGS

For a more complete understanding of the present invention and its advantages, reference is now made to the following descriptions, taken in conjunction with the accompanying drawings, in which:

FIGURE 1 illustrates a typical supply chain planning system;

FIGURE 2 illustrates how a planning process for a large scale supply chain can be performed more rapidly than the planning process shown in FIGURE 1;

FIGURE 3 illustrates an example distributed, parallel supply chain planning system, in accordance with one embodiment of the present invention;

FIGURE 4 illustrates an example method for solving a large-scale supply chain problem, in accordance with one embodiment of the present invention; and

FIGURE 5 illustrates an example method for solving a large-scale supply chain problem, in accordance with a second embodiment of the present invention.

DESCRIPTION OF EXAMPLE EMBODIMENTS

The preferred embodiment of the present invention and its advantages are best understood by referring to FIGURES 1-5 of the drawings, like numerals being used for like and corresponding parts of the various drawings.

FIGURE 3 illustrates an example system 100 for solving a large-scale supply chain planning problem, in accordance with one embodiment of the present invention. For this example embodiment, a partitionable database technology is preferably used. For example, a partitionable database, such as an Oracle® 8i Database, Enterprise Edition with Partitioning Option, can be used. System 100 includes a database 102 with a plurality of partitions 102(a), 102(b), ... 102(n), and a corresponding number of planning process applications 104(a), 104(b), ... 104(n). Although database 102 is described in this example as including three partitions (i.e. n=3), database 102 can include two or more partitions in accordance with particular planning process design needs. Preferably, the number of partitions is selected to equal the number of planning process applications to be used.

Each planning process application 104(a-n) is coupled to a corresponding partition 102(a-n) by a respective communication link 106(a-n) for database read and write operations. A respective computer processor (not shown) can be used to execute the planning software for each planning process application 104(a-n). Notably, by linking each planning process application (and processor) to a different database partition, in accordance with this embodiment of the present invention,

the database read and write contention problems experienced by previous systems may be eliminated.

In operation, a supply chain planning problem is divided (e.g., by a system planner or designer) into a plurality of independent, isolated sub-problems (e.g., N sub-problems). For this example, a large-scale supply chain planning problem is split into three independent, isolated sub-problems (i.e., N=3). Each sub-problem is assigned to be solved by a different planning process application, such as for example, 104(a)-(c).

The process of dividing a large-scale planning problem into a plurality of sub-problems is referred to as "decomposition". A primary goal of the decomposition process is to identify the smallest possible, independent sub-problems (referred to as "clusters"), and create larger sub-problems (referred to as "partitions") made up of clusters. The sub-problem partitions are developed with clusters and sized to fit into respective database partitions. From a technical standpoint, the database partitions may be sized equally for optimum performance. Therefore, the decomposition process is also responsible for filling up the database partitions with clusters, preferably such that they are as close to equal in size as possible.

For this embodiment, a cluster can be represented by a set of items (e.g., inventory data) that are related with respect to the planning problem to be solved. Notably, the present invention is not limited to this definition of a cluster. For example, a cluster can also include items at different locations or other entities. As such, a cluster can be identified by certain rules. Each rule defines a relationship between two or more

items.   If the decomposition process identifies a
relationship between any two items, the two items are
preferably placed in the same cluster.

Specifically, a clustering algorithm executed by the
decomposition process initially creates a cluster for
each item related to the planning problem to be solved.
As the relationship rules related to a cluster are
processed, the clustering algorithm identifies any
relationship that exists between items in different
clusters, and merges these clusters.   When no additional
relationships between items in the resulting clusters can
be identified, the clustering algorithm is terminated.   A
result or output of a clustering algorithm is a set of
independent clusters.

A sub-problem partition is represented by a set of
independent clusters.   Preferably, during the process of
developing sub-problem partitions from clusters, all of
these partitions are sized as close to equal as possible.
All of the data elements associated with each item in a
sub-problem partition are then stored in a corresponding
physical database partition.   For example, all of the
data elements for a sub-problem partition associated with
planning process application 104(a) may be stored in
partition 102(a), all of the data elements for planning
process application 104(b) may be stored in partition
102(b), and so on.

Notably, although the use of clusters to develop
sub-problem partitions during the decomposition process
is preferred, decomposition can also be performed without
clusters.   For example, sub-problem partitions can be
created directly for items related to the planning
problem to be solved.   An appropriate partition

identification label or PARTITION_ID can be assigned to each item residing in the respective sub-problem partitions. The decomposition algorithm can then assign the data for each item to an appropriate database partition.

Preferably (returning to the use of clusters), before any data is initially loaded into the database 102 for production purposes, only that data which is relevant to the decomposition process is loaded into a default database partition. This data stored in the default partition is processed by the decomposition algorithm in accordance with the decomposition rules imposed. The decomposition algorithm is then executed to produce the independent sets of clusters and the partition assignments of data. Next, all of the data to be used for production purposes is loaded in the database 102. During the process of loading the data into database 102, the partition assignments derived by the decomposition algorithm are used to store the sub-problem partition data in an appropriate database partition 102(a-n).

The present invention also covers the incremental situation whereby decomposition and/or business rules are changed, or data associated with new items are added to or deleted from the database 102 over a period of time. In this case, the existing database partitioning scheme is preferably changed as little as possible in order to maintain database stability, because the process of re-partitioning data in a database can be very expensive in terms of lost time.

For the incremental situation described above, if new items are to be loaded into the database 102, the data associated with each new item are loaded into a

default database partition. The decomposition algorithm
detects the existence of the new items stored in the
default partition and then creates one or more new
clusters from that data, or merges the data with existing
5   clusters, in accordance with the existing decomposition
and/or business rules imposed. For this embodiment, a
rebalancing algorithm is preferably executed, which
rearranges the database partition assignment for the new
(or changed) clusters, as needed. Whenever an existing
10   cluster is to be changed, the partition decomposition
algorithm moves all of the data associated with that
cluster from the originally-assigned partition to the
newly-assigned partition (if a different partition is
assigned). A similar workflow process is performed if a
15   relationship rule is changed. As such, during the
incremental decomposition process, if items and/or
relationship rules are deleted but not added, then the
existing clusters are not changed to ensure that the
partition assignments are not disturbed. Alternatively,
20   for example, existing clusters can be changed without
disturbing the partition assignments, by re-clustering
the items in the clusters affected. In sum, the
incremental decomposition algorithm processes only a
subset of the data that is processed by the initial
25   decomposition algorithm. Consequently, an incremental
decomposition can be executed faster than an initial
decomposition.

FIGURE 4 illustrates an example method 200 for
solving a large-scale supply chain problem, in accordance
30   with one embodiment of the present invention. For
example, the decomposition algorithm described directly
above can be implemented for initial database loading and

planning execution, in accordance with the method shown in FIGURE 4. At step 202, the decomposition algorithm divides the supply chain problem into N sub-problems, and divides the database 102 into N partitions. Referring to

5   the system shown in FIGURE 3, the database 102 is divided into 3 partitions 102(a)-102(c). At step 204, a processor (not shown) loads the data needed for decomposition purposes into appropriate tables in the database 102, in accordance with the business rules and

10   design constraints imposed. At step 206, a clustering algorithm (e.g., part of the decomposition algorithm) iteratively constructs a plurality of clusters, with each such cluster composed of items associated by a pre-defined set of relationship rules. As the clusters are

15   developed, the clustering algorithm assigns an appropriate cluster identification label (e.g., cluster #1) or CLUSTER_ID to each item residing in the respective clusters. At step 208, the clustering algorithm constructs N sub-problem partitions by merging clusters

20   having related items. As the sub-problem partitions are developed, the clustering algorithm assigns an appropriate partition identification label (e.g., partition #1) or PARTITION_ID to each item residing in the respective sub-problem partitions. The clustering

25   algorithm also sizes the sub-problem partitions as close to equal as possible. The clustering algorithm is terminated when no additional relationships between items in different clusters can be identified. At this point, sets of independent clusters are associated with

30   respective sub-problem partitions, and these sub-problem partitions are sized as close to equal as possible. At step 210, the decomposition algorithm loads the data

associated with each item into database 102. While the
data are being stored, the decomposition algorithm
assigns the data for each item to an appropriate database
partition (e.g., 102(a)-102(c)) according to each item's

5   PARTITION_ID.   At step 212, the N planning process
applications (e.g., 104(a)-(c)) can be executed in
parallel. In accordance with the present invention, each
planning process application accesses data in a
respective database partition, which eliminates the

10   read/write contention problems experienced by prior
planning processes.

FIGURE 5 illustrates an exemplary method 300 for
solving a large-scale supply chain problem, in accordance
with a second embodiment of the present invention. For

15   example, the decomposition algorithm described above can
be implemented for incremental database loading and
planning execution, in accordance with the method shown
in FIGURE 5. At step 302, the decomposition algorithm
loads all data associated with any new items(s)

20   temporarily into a default database partition (e.g.,
102(d)).   At step 304, the clustering algorithm
constructs one or more new clusters for the new data,
and/or associates some or all of the new data in one or
more existing clusters. The clustering algorithm then

25   assigns an appropriate CLUSTER_ID to each new item. At
step 306, the clustering algorithm iteratively merges one
or more of the new clusters, if any, and/or re-balances
the existing clusters as needed to form suitable sub-
problem partitions. Notably, it is preferable to merge

30   or re-balance the clusters in such a way that the
movement of data across the database partitions is
minimized.   The clustering algorithm then assigns an

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appropriate PARTITION_ID to each item, as needed, in the resulting sub-problem partition(s). At step 308, the decomposition algorithm loads the data associated with the new items into the appropriate database partition(s),

5   in accordance with the assigned PARTITION_ID. Advantageously, in accordance with the present invention, the example decomposition methods shown in FIGURES 4 and 5 produce a relatively high level of scalability for large-scale supply chain planning problems compared to

10   previous methods.

Although a preferred embodiment of the method and apparatus of the present invention has been illustrated in the accompanying drawings and described in the foregoing description, it will be understood that the

15   invention is not limited to the embodiment disclosed, but is capable of numerous rearrangements, modifications and substitutions without departing from the spirit of the invention as set forth and defined by the following claims.